

# Mathematical Interfaces of Automated Scientific Computing

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October 21, 2009  
Computing Techniques seminar  
Fermilab

# Acknowledgments

- L. Ridgway Scott (University of Chicago)
- Matthew R. Knepley (Argonne National Lab)
- Dmitry A. Karpeev (Argonne National Lab)
- Robert C. Kirby (Texas Tech University)
- Kevin R. Long (Texas Tech University)
- Anders Logg (Simula Research Lab)

- 1 Science and Computing
  - Big Science
  - Little Science
- 2 The Automation of Scientific Computing
  - Algebraic Solvers
  - Functional Spaces
  - Equation Descriptions
  - Domain Representations
- 3 The Future of Scientific Computing

Science and  
Computing

Big Science  
Little Science

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Algebraic Solvers  
Functional Spaces  
Equation Descriptions  
Domain Representations

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### Science and Computing

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# Why do simulations?

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# Why do simulations?

Because experiments are **expensive**

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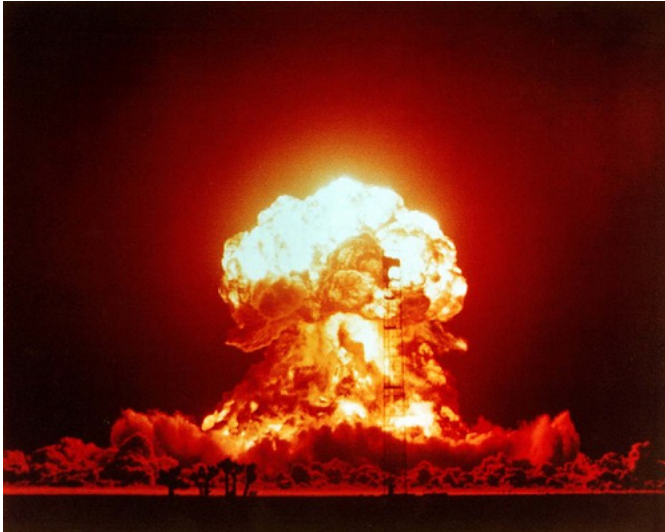
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# Why do simulations?

Because experiments are **dangerous**



# Why do simulations?

Because experiments are **not possible**



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# Why do simulations?

Because simulations are **faster**

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# Why do simulations?

Because we need the data **ASAP**



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## Science and Computing

Algebraic Solvers

### Equation Descriptions



- D'Alembert's Paradox
- Supernova flashback
- Rayleigh-Taylor Constant

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# Simulation: Third Tier of Science

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- D'Alembert's Paradox
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- D'Alembert's Paradox
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# Big vs Little Science

*The goal of this session is explore whether, when and why universities should do **big** or **little** science. Panelists may discuss why **big science wastes money, exploits graduate students and makes research too short range**. They may argue that **little science produces results that are too deep and narrow, oblivious to global systems issues, not properly validated, and too out of touch with reality** to ever be practical. Panelists may also find some advantages to both kinds of science.*

ACM SIGARCH Computer Architecture News  
Volume 18, Issue 3a, June 1990

# Big Science and Big Computers

- Requires large, highly specialized coding projects
- Incredibly hard to design for maintainability, feature addition, and new hardware paradigms
- Resolves large open phenomena (or asks for more money)



# Little Science and Rapid Development

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**Little Science**

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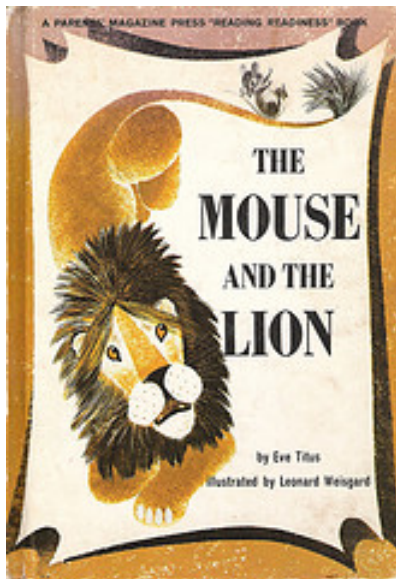
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- Able to use inefficient (general) methods
- Usually only test on small problems
- Can use (somewhat) exhaustive search of different possible methods.
- High Productivity Environment

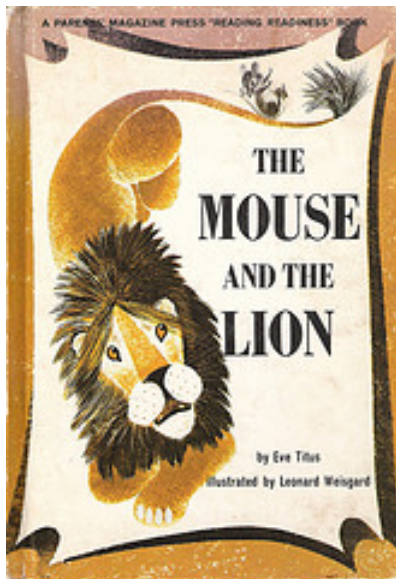
# Automation becomes the Thorn

- Pervasive abstractions
- Write general code,  
Generate specific code
- Fails due to bad  
interfaces



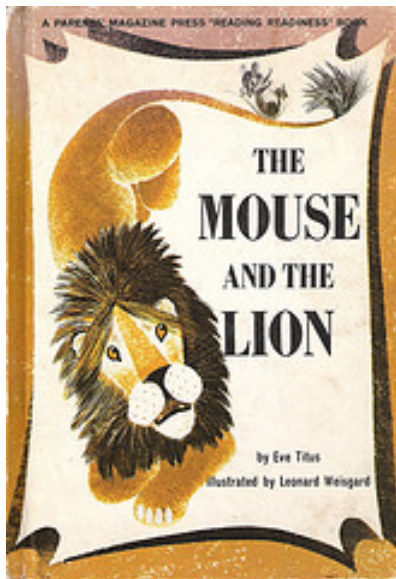
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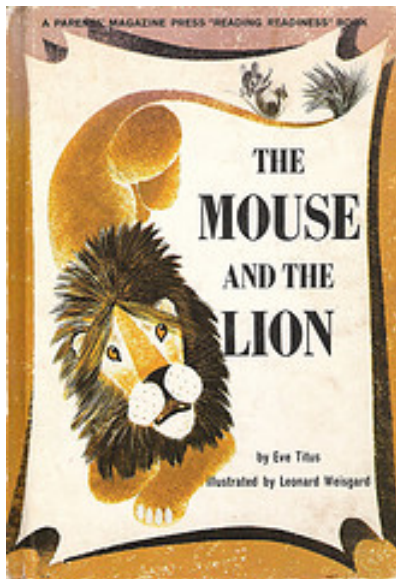
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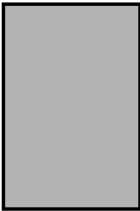
# The Productivity Factors

How much code do I have to write:

Written Code	Generated Code
ANSI C: 50 lines	Assembler: 200 lines
FFC: 10 lines	C++: 20K lines
Quantum Chemistry: 6 symbols	FORTTRAN: 1M lines

# The FEM-PDE model

Find  $u$  on domain  $\Omega$ , given  $f$  and BC

$$-\Delta u = f$$


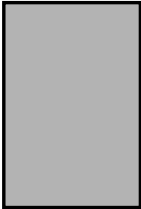
The diagram shows a gray rectangular domain  $\Omega$  with a black border. The boundary conditions are specified as follows:

- Top boundary:  $u = T0$
- Bottom boundary:  $u = T1$
- Left boundary:  $u'=0$
- Right boundary:  $u'=0$



# The FEM-PDE model

Find  $u$  on domain  $\Omega$ , given  $f$  and BC,  
such that for all  $v$  in the function space  $S$

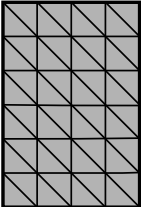
$$a(u,v) = (f,v)$$


The diagram shows a rectangular domain  $\Omega$  with the following boundary conditions:

- Top boundary:  $u = T0$
- Bottom boundary:  $u = T1$
- Left boundary:  $u' = 0$
- Right boundary:  $u' = 0$

# The FEM-PDE model

Find  $u_h$  on a triangulization of domain  $\Omega$ ,  
given  $\bar{f}$  and BC,  
such that for all  $v$  in the function space  $S$

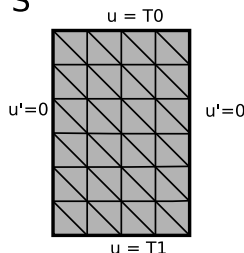
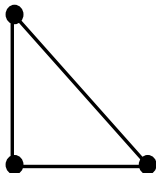
$$a(u_h, v) = (f, v)$$


The diagram shows a square domain  $\Omega$  discretized into a  $4 \times 4$  grid of triangles. The top boundary is labeled  $u = T0$ , the bottom boundary is labeled  $u = T1$ , and the left and right boundaries are labeled  $u' = 0$ .

# The FEM-PDE model

Find  $u_h$  on a triangulization of domain  $\Omega$ ,  
given  $\bar{f}$  and BC,  
such that for all  $v_h$   
in the function space  $V \subset S$

$$a(u_h, v_h) = (f, v_h)$$



# The FEM-PDE model

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$$\begin{bmatrix} & \\ & \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} b_1 \\ b_2 \end{bmatrix}$$

# The FEM-PDE model

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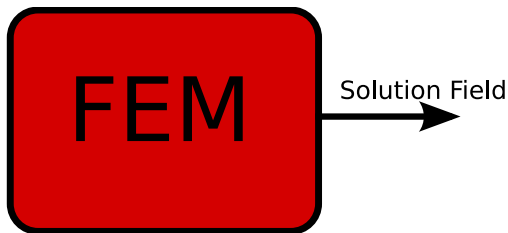
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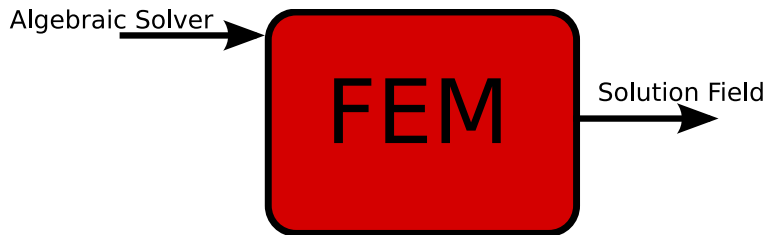
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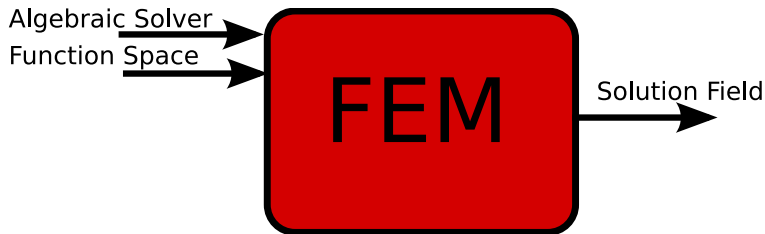
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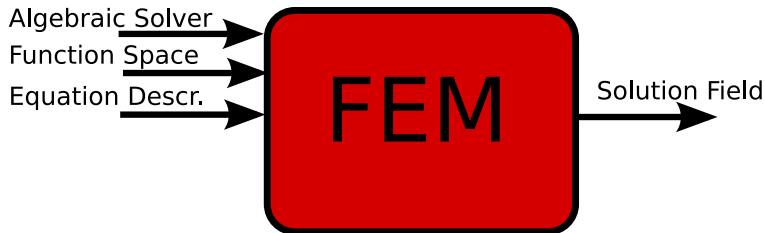
# The FEM-PDE model



# The FEM-PDE model

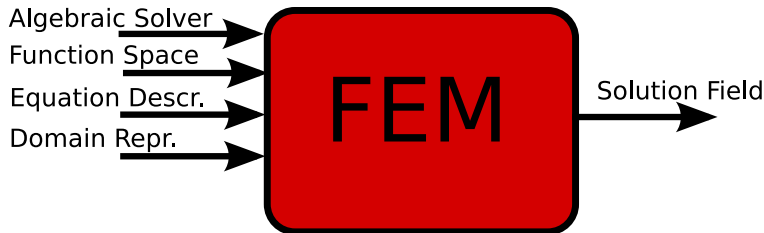


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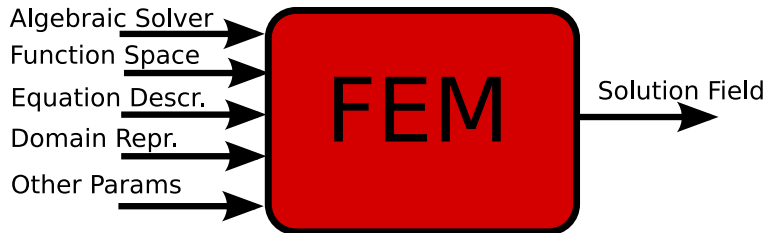




# The FEM-PDE model



# The FEM-PDE model



# Mathematics Necessary

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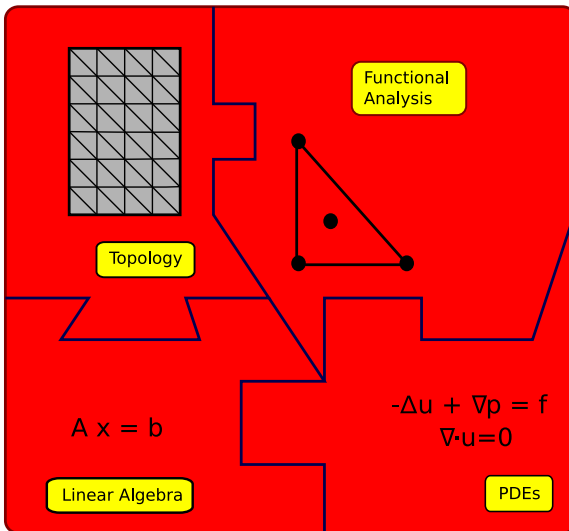
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# Algebraic Solvers

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- Model is able to capture lots of computations
- Reisz Representation Theorem

# The Large Scale Success Story

- BLAS
- LAPACK
- Scalapack
- Atlas
- Flame
- Trilinos
- PETSc
- Hypre
- ... More to come (Salsa)

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**Algebraic Solvers**

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# Functional Spaces

## Stokes Equation

- Taylor-Hood
- Crouzeix-Raviart
- Iterated Penalty

$$\begin{aligned} -\Delta \mathbf{u} + \nabla \mathbf{p} &= \mathbf{f} \\ \nabla \cdot \mathbf{u} &= 0 \end{aligned}$$



$$\frac{du}{dt} + u \cdot \nabla u = -\frac{\nabla \mathbf{p}}{\rho} + \nu \Delta \mathbf{u}$$

## Navier-Stokes

- Stokes Solver
- Nonlinear Solver
- Time Stepping

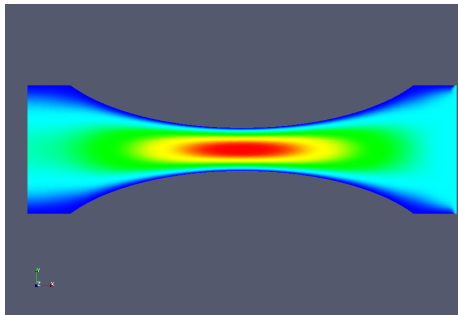
### Stokes Equation

Taylor-Hood

Crouzeix-Raviart

Iterated Penalty

# Function Space Matters



## Stokes Equation

Taylor-Hood  
Crouzeix-Raviart  
Iterated Penalty

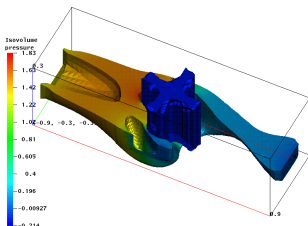
## Navier-Stokes

Stokes Solver  
Nonlinear Solver  
Time Stepping

## Non-Newtonian Flow

- Oldroyd-B
- Grade 2

# Function Space Matters



**Stokes Equation**  
Taylor-Hood  
Crouzeix-Raviart  
Iterated Penalty

**Navier-Stokes**  
Stokes Solver  
Nonlinear Solver  
Time Stepping

**Non-Newtonian**  
Odroyd-B  
Grade 2

...

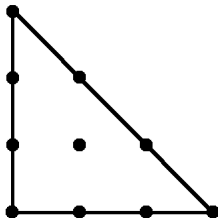
## Fluid Solid Interfaces

- Free Boundary Problems
- Couple to legacy Codes

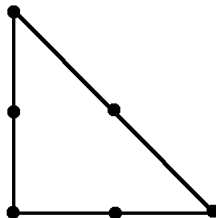
# Success Story

- FIAT Algorithm [Kirby 2005]
- Syfi [Mardel et al 2007]

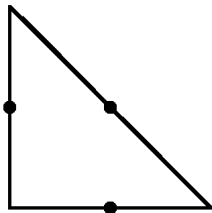
# Stokes Function Spaces



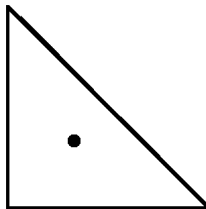
(a)  $P_3$  for  $V$



(b)  $P_2$  for  $\Pi$



(c) Crouzeix-Raviart  
for  $V$

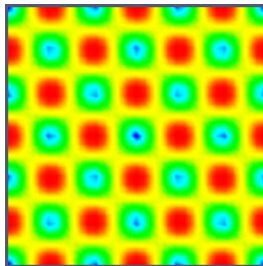


(d)  $P_0$  for  $\Pi$

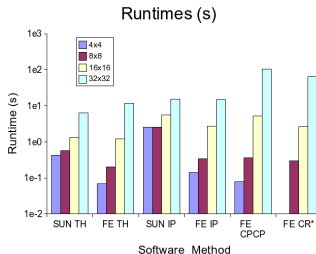
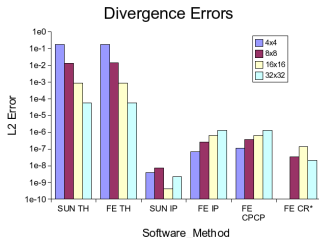
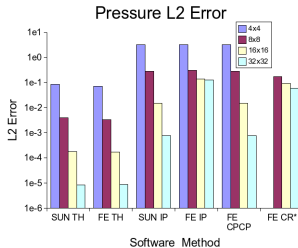
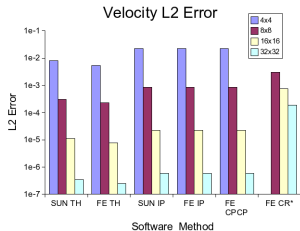
# Problem statement

$$\mathbf{u} = \begin{bmatrix} \sin(3\pi x) \cos(3\pi y) \\ -\cos(3\pi x) \sin(3\pi y) \end{bmatrix}$$

$$p = \sin(3\pi x) \sin(3\pi y)$$



## Comparison of Fourth Order



# Equation Description



# Optimization

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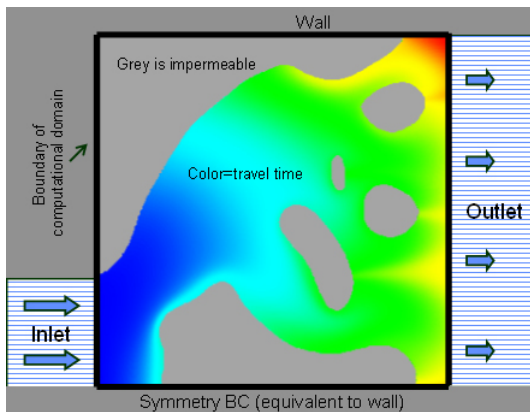
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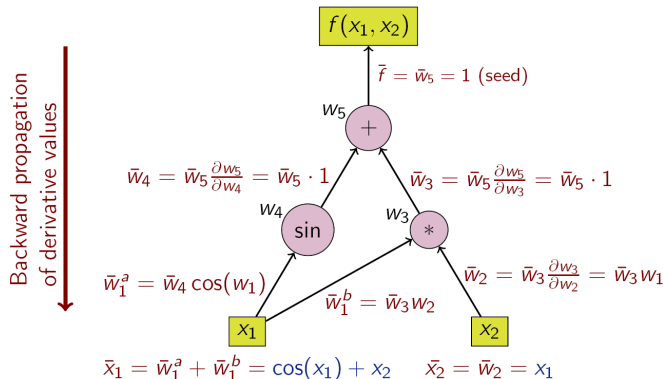
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# Automatic Differentiation



# Domain Representation

# Two Applications



# Two Applications



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# Sieve

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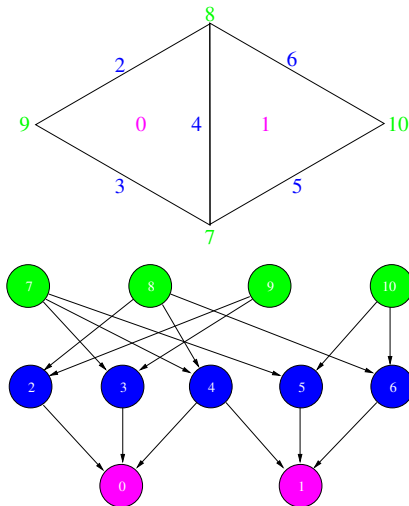
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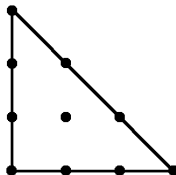
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## Simple Mesh

Points: 1,2,3

Edges: (1,2),(1,3),(2,3)

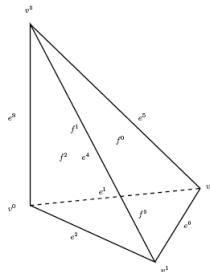
Face: (1,2,3)

## Sieve Mesh

Points: 1,2,3

Edges: support(Points)

Face: support(Edges)



## Simple Mesh

Points: 1,2,3,4

Edges: (1,2),(1,3),  
(1,4),(2,3),(2,4),(3,4)

Face: (1,2,3),(1,2,4),  
(1,3,4),(2,3,4)

## Sieve Mesh

Points: 1,2,3,4

Edges: support(Points)

Faces: support(Edges)



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### Domain Representations



Unsupported.

Edges: support(Points)

Faces: support(Edges)

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# Automation Standard

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Already Matlab is standard. Why?

Already Matlab is standard. Why?

Because with ' $\backslash$ ', the user does not have to choose between the following algorithms:

- Cholesky factorization
- QR factorization
- LU factorization
- Gaussian elimination with partial pivoting
- Least Squares fitting

# Computing = Big Computing

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We should not settle for less

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